



# **Modeling and Forecasting**

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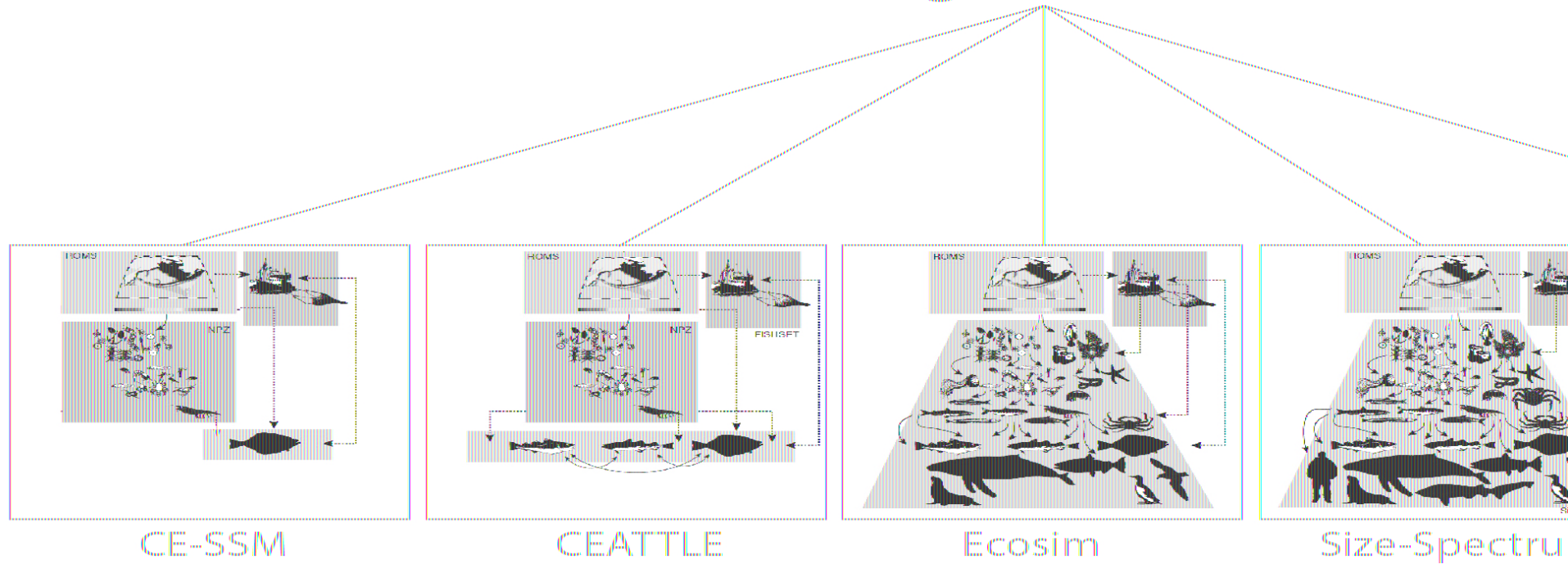
# “Ecosystem” models by region

	<b>EBS</b>	<b>GOA</b>	<b>AI</b>	<b>ARCTIC</b>
ROMS/NPZ	*	o		?
Enhanced assessment	*	*	*	
Technical interactions	+			
Food web	+	+	+	o
Multispecies statistical	*	?	o	
FEAST-spatial	*			
IBM	o	o		
Size Spectrum	o			
<i>Qualitative network</i>	?	?		

- \* Annual or biennial part of assessment, requested or required by Council.
- + Up-to-date for providing issue-specific advice.
- o Under active development.
- ? Proposed.

# Bering Sea operational suite

## Bering Sea Models



Additive Pressures

Multiple Interacting (non-linear) Pressures

Spatial

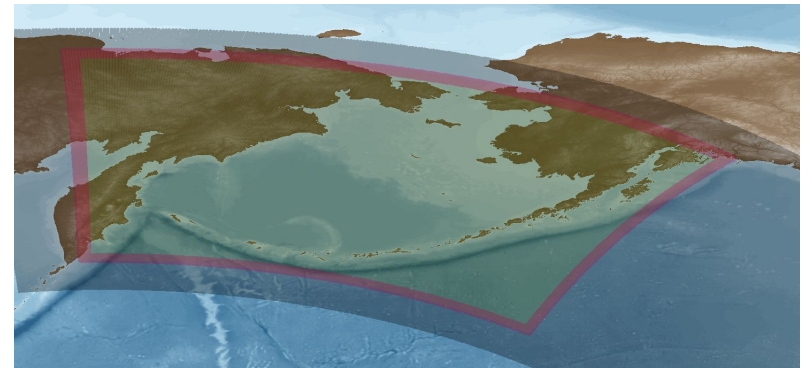
Non-linear Species Interactions; Non-linear Cumulative Effects

Estimation of Error/ multiple random iterations

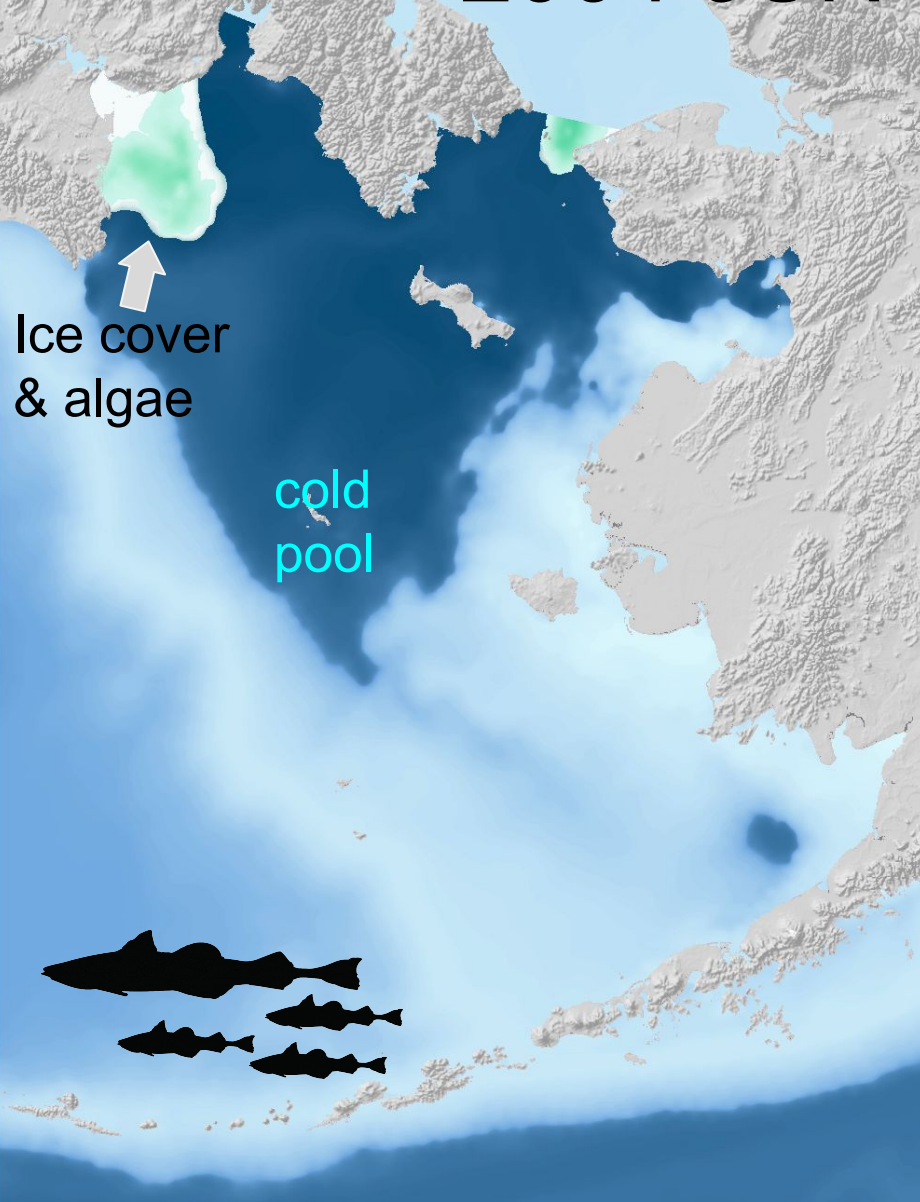


## **Bering ROMS (Regional Oceanographic model)**

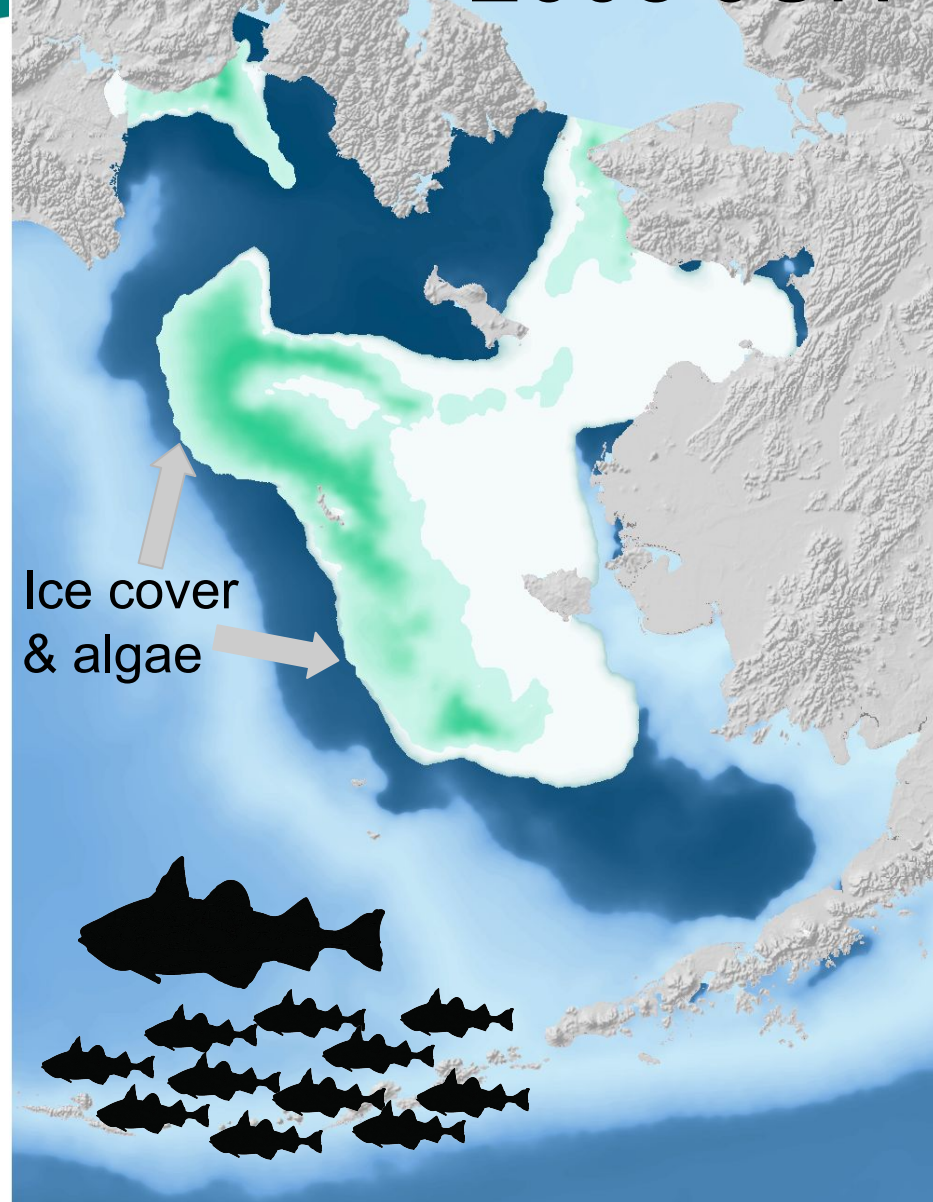
- Developed with NSF/NPRB (Bering Project)
- Ongoing IEA partnership (AFSC/PMEL)
- Significant advances in ice modeling, ice plankton
- Products
  - 40-year hindcast (1971-2012)
  - Nowcasts (annual)
  - 9-month forecast (annual)
  - Forecasts to 2100 with IPCC outputs
  - Rapid Climate Assessment



2004 JUN

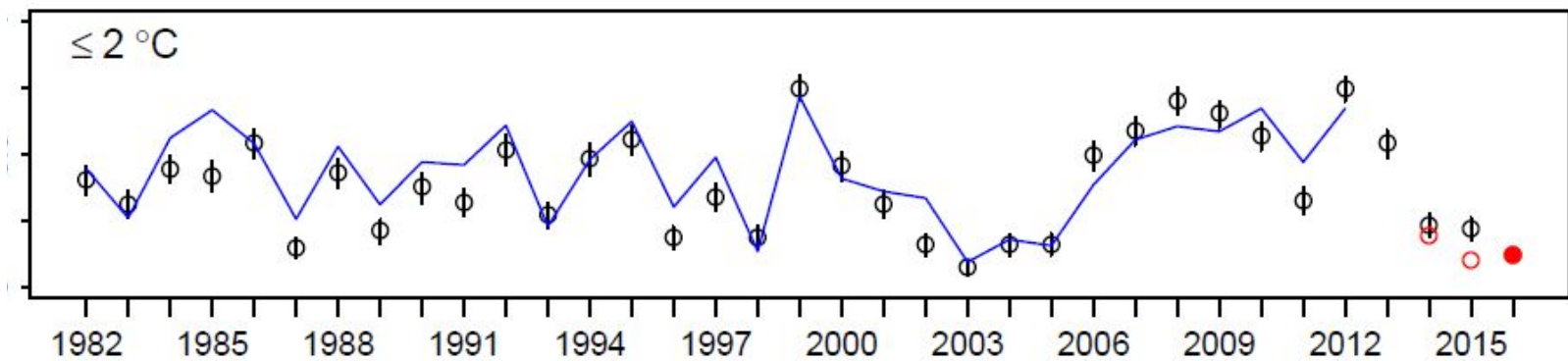


2008 JUN





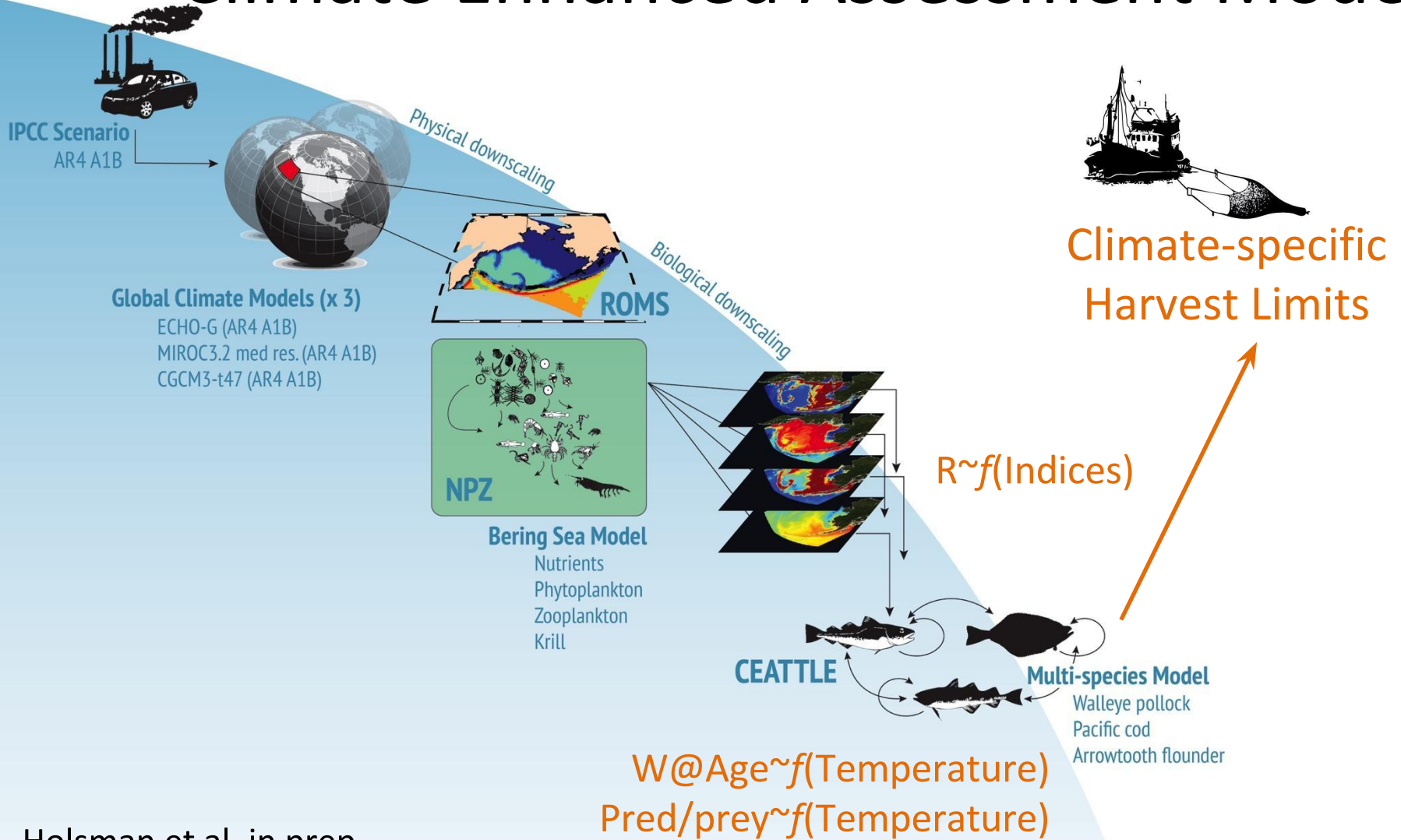
## 9-month forecast – cold pool



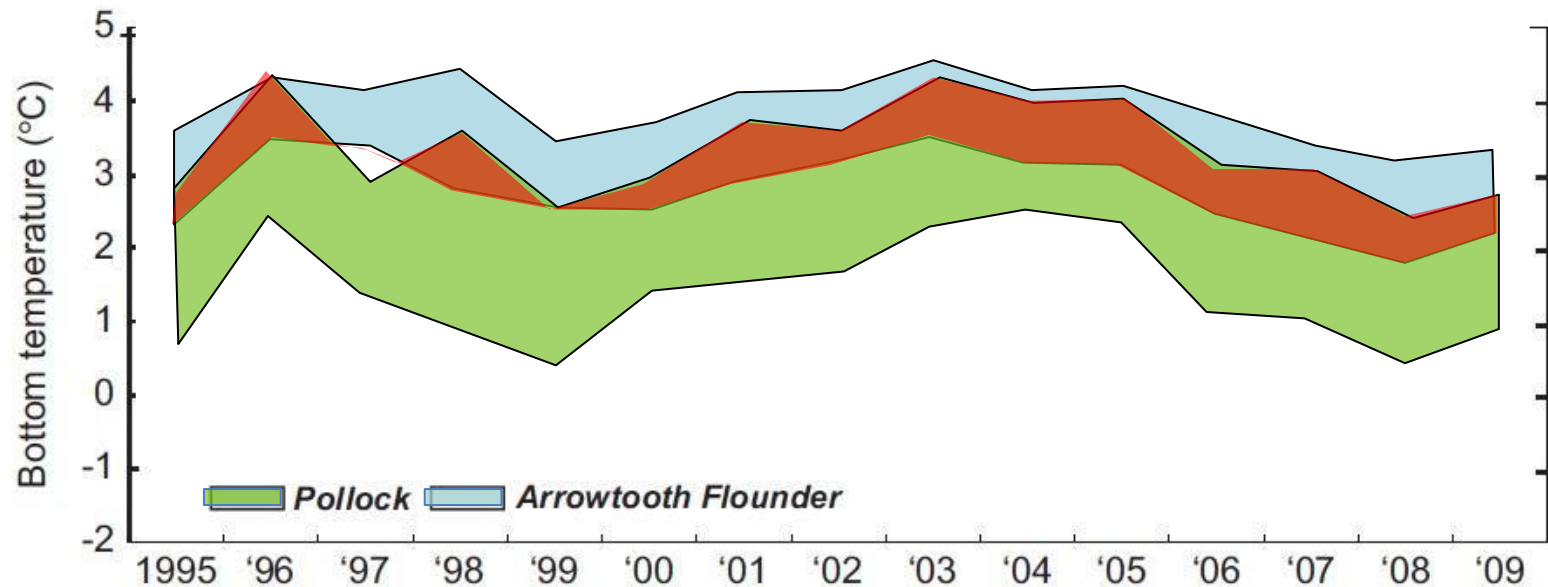
- Included in annual ecosystem chapter (November prediction for following summer)
- Strong traction/interest in fishing community
- Forecast led to increased oceanographic field presence in 2015 (unprecedented warmth forecast)
- Review: not all metrics well-predicted; e.g. SST shows biases.



# Climate Enhanced Assessment Models



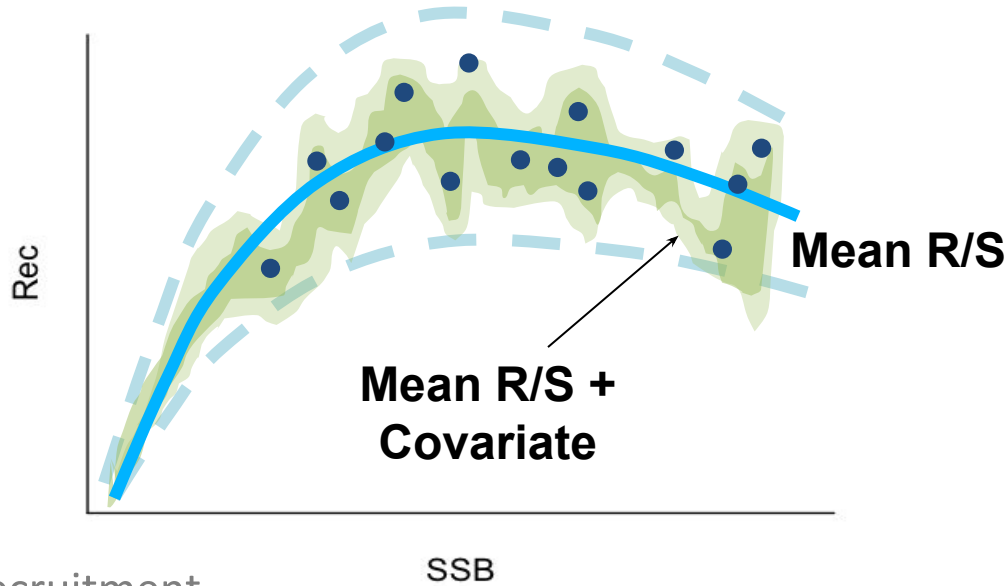
# Pred-prey overlap based on thermal envelopes



Stabeno et al. (2013) A comparison of the physics of the northern and southern shelves of the eastern Bering Sea and some implications for the ecosystem. *Deep-Sea Res II* 65-70:14-30.



# CEATTLE Recruitment – ROMS forced forecasts



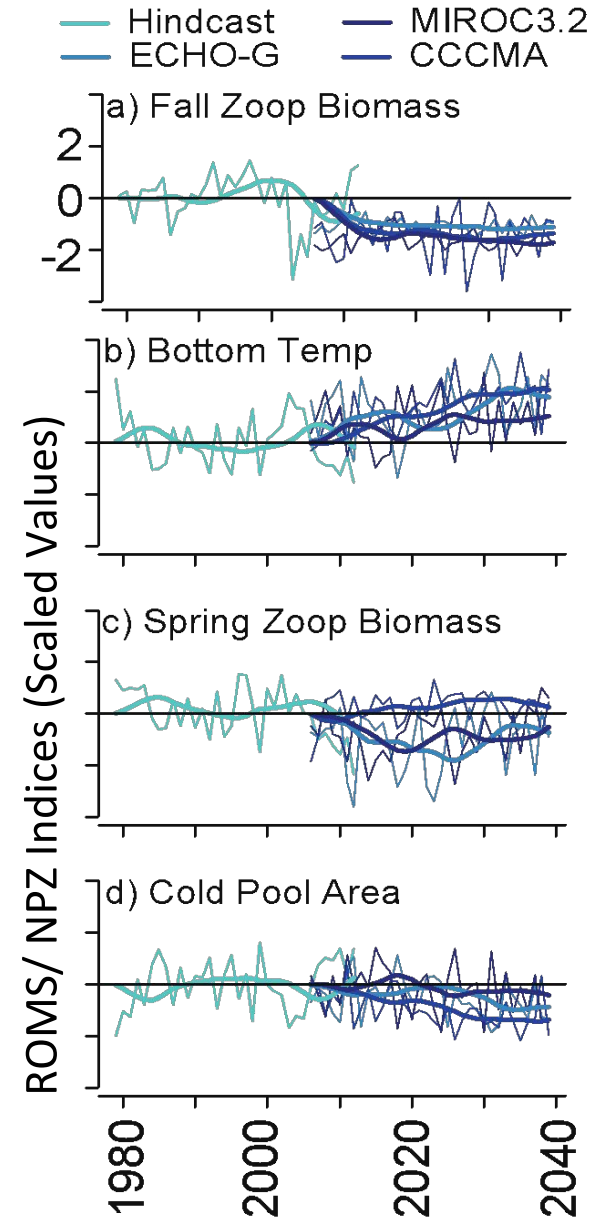
$$\log(R_t) = \underbrace{\log(\alpha \cdot B_{t-1})}_{\text{productivity}} - \underbrace{\beta_1 \cdot B_{t-1}}_{\text{carrying capacity}} + \underbrace{\sum \beta_k \cdot X_{k,t}}_{\text{environmental effects on carrying capacity}} + \varepsilon,$$

recruitment

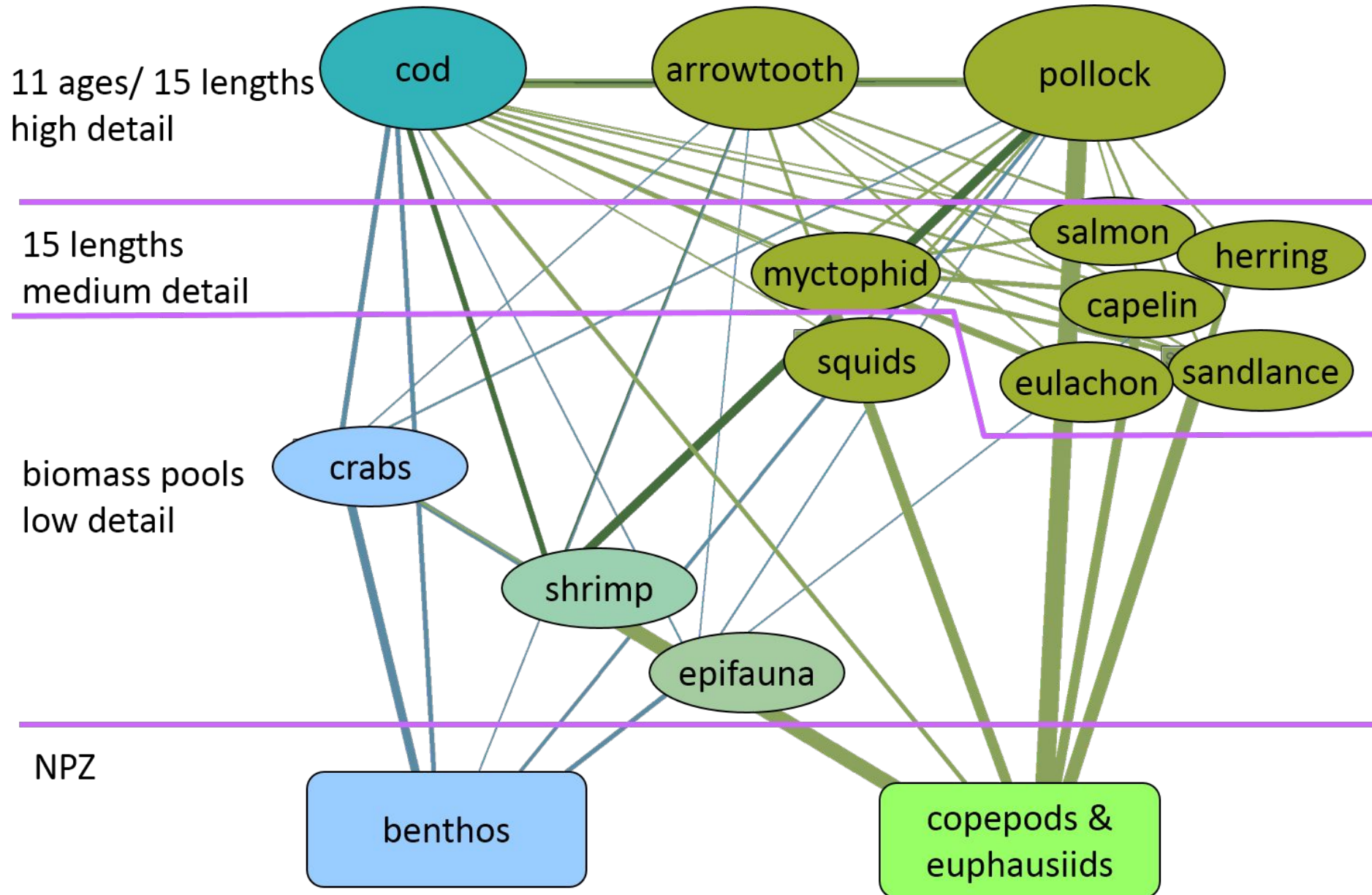
productivity

carrying capacity

environmental effects on carrying capacity



# FEAST – 10km<sup>2</sup> Bering Grid trophic structure and population dynamics



# FEAST – Forage Euphausiid Abundance in Space and Time

Forage-fish centered, driven by diet interactions

Size/species  
prey  
preference



Age,  
length,  
species

Percent weight in pollock diet of copepods, euphausiids and pollock

Jan-March

Apr-Jun

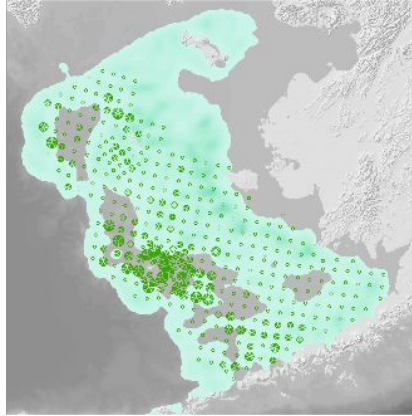
Jul-Sep

Oct-Dec

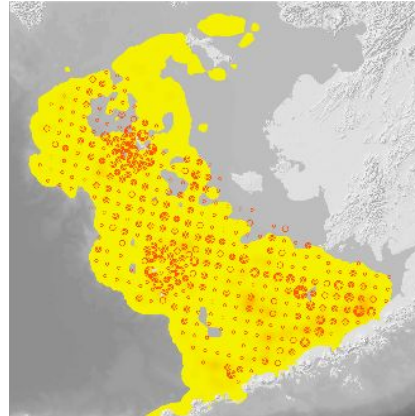
Percent weight in pollock diet by prey



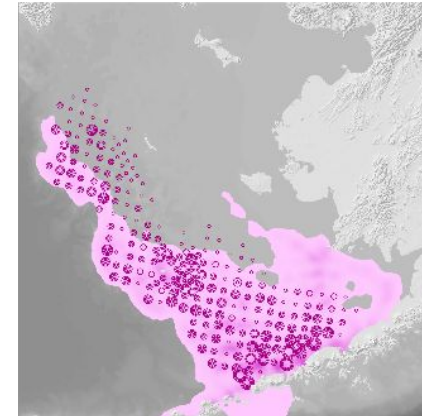
# Summer adult distribution – FEAST vs data



Pollock

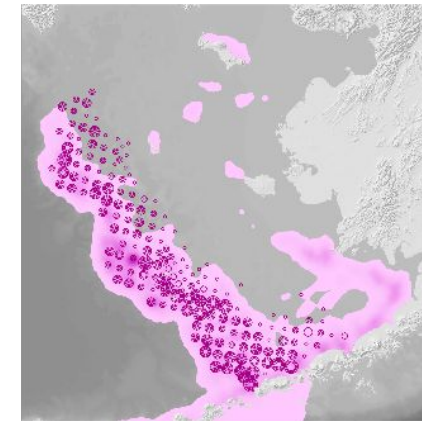
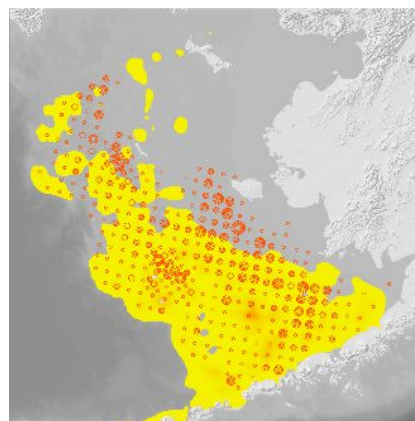
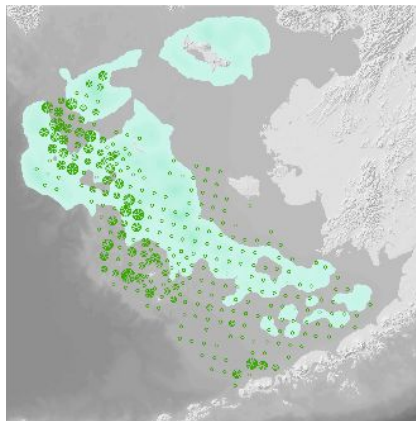


Cod



Arrowtooth

2004



2008

Circles are bottom-trawl data; shading is FEAST modeled distribution



## **FEAST uses**

- Primarily for forage fish/zooplankton interactions with climate
- Not “whole ecosystem” – missing benthos (flatfish, crabs)
- Includes fleets, future fleet predictive dynamics
- Predicts conditions for predators
  - Specific management uses: Cod and ATF explicitly; fur seals, birds, Chinook salmon implicitly

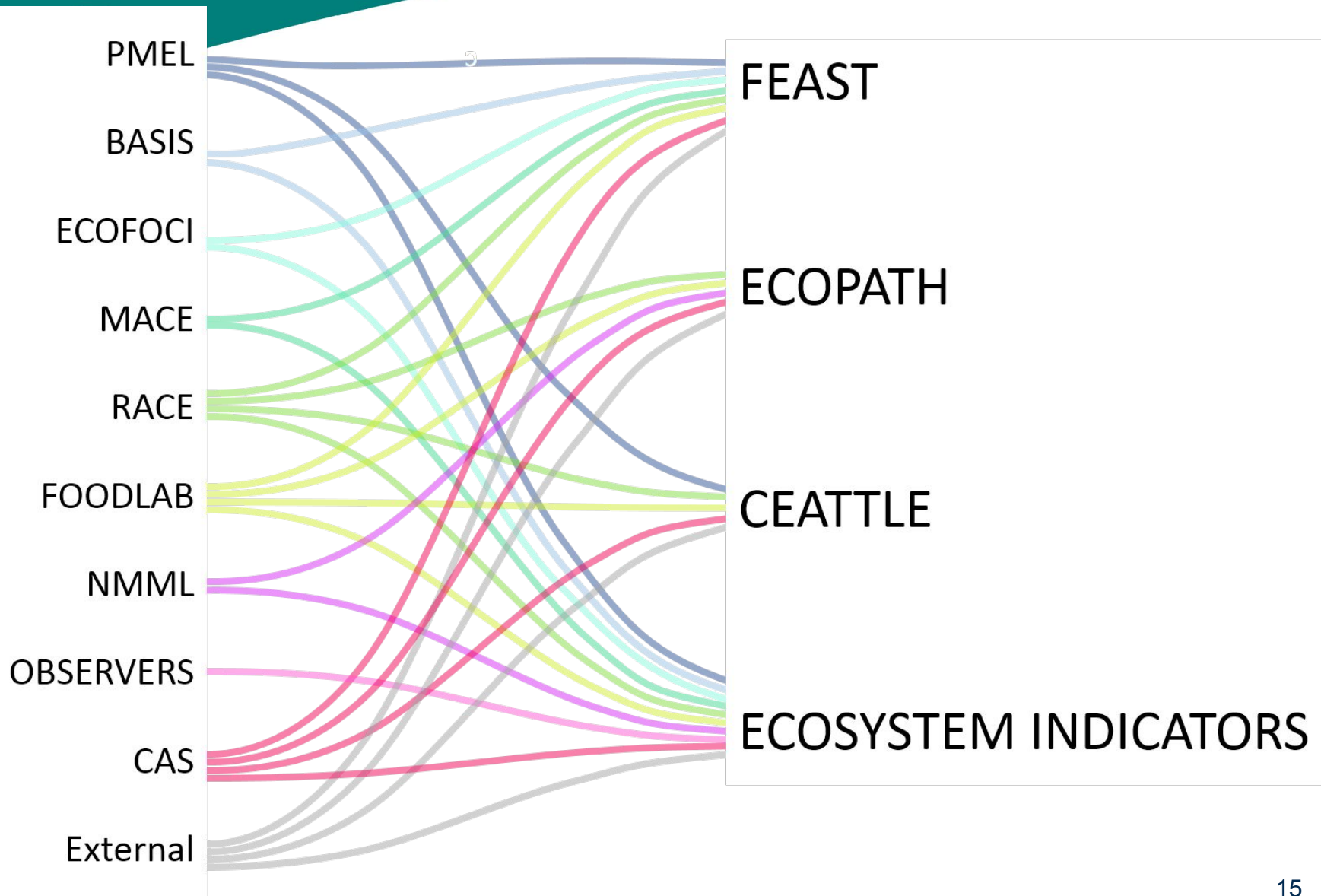
# Data types and availability

	RAW	Magnitude estimates	Rates	Process	ad hoc
PMEL	○		○	○	⊙
BASIS	○			○	⊙
ECOFOCI	○			○	
MACE	○	○			
RACE	●	●	●	●	⊙
FOODLAB	●	●		●	⊙
NMML	○	○	○	○	
OBSERVE RS	●				⊙
	●		●		⊙
CAS	○	○			⊙
EXTERNAL					

○ Database nonpublic      ● Database public      ⊙ Modeler developed from nonpublic      ⊙ Modeler developed from public



## Data flow to models





## Food web modeling – Ecopath/Ecosim

- All four regions
- Multiple reviewed uses in ecosystem assessment (2005-present)
- Annual assessment use: guild-level analysis
- **Cumulative/ecosystem level indicators**
- R-based fitting tools/development



# Technical Interactions Model

(Ono et al.)

- Single-species stock assessment models linked through interacting gears (no interspecies interactions).
- Model and predict fisheries given wide range of current constraints.
- “Human behavior realistic” cumulative catch and constraints.

$$1. \sum_{k=1}^{n_{\text{metier}}} d_{k,t} C_{j,k,t} \leq TAC_{j,t}$$

*“Target species quota constraints”*

$$2. \sum_{k=1}^{n_{\text{metier}}} d_{k,t} C_{\text{bycatch},k,t} \leq \text{Bycatch limit}$$

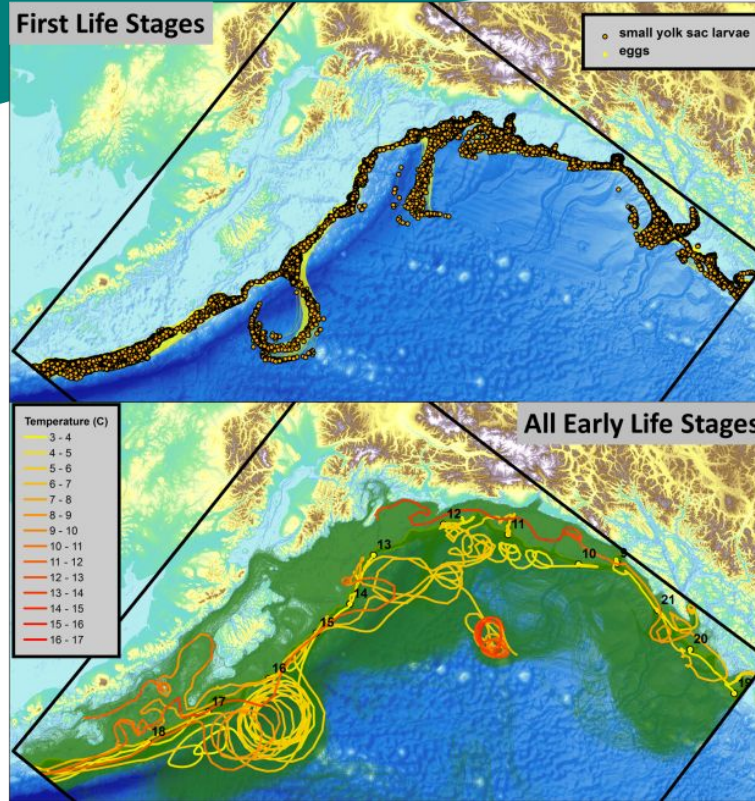
*“Bycatch limit = 4575 (halibut limit)”*

$$3. \sum_{k=1}^{n_{\text{metier}}} \sum_{j=1}^{n_{\text{species}}} d_{k,t} C_{j,k,t} \leq \text{Hard cap on yield}$$

*“The hard cap” =  $1.7e^6$  t*

$$4. \lambda_1 d_{k,t=1} \leq d_{k,t} \leq \lambda_2 d_{k,t=1}$$

*“Métier concentration factor: contraction ( $\lambda_1$ )/expansion ( $\lambda_2$ )”*



## Gulf of Alaska Modeling

- GOA-IERP developed ROMS model, IBM models for recruitment.
- Freshwater input and other dynamics not strongly captured by current atmospheric forcing, still in “research” mode.
- GOA-IEA pre-modeling steps: Conceptual Model building (stakeholder/scientists)



## **TOR 6: Inclusion**

- Annual indices part of ecosystem chapter
  - Guild biomass and exploitation, natural mortality estimates
- Inclusion of 9-month forecast indices based on predictive power in hindcasts
- 5-year strategic re-assessment of climate forecasts part of FEP Action Module
- ROMS/NPZ projections will form the basis of the Climate Vulnerability Assessment
- Climate Science Strategy will include outputs from ACLIM model suite



## **TOR 7: peer review**

- ROMS physical results reviewed for indicator provision
- Starting 2016, CEATTLE to be reviewed as “alternate” model in EBS pollock stock assessment
- Ecopath models underwent CIE review for management purposes
- Evaluating robustness of ecosystem indicators under climate change (FATE project)
- Evaluation of thermal envelopes of commercial groundfish under climate change





## **TOR 8: communication**

- MSEs conducted/in progress with stakeholder input
- Outputs (hindcast, long-term forecast) available on AOOS, other web portals
- ACLIM includes webinars and iterative discussion with councils

# Strengths, Challenges, Solutions

**S:** History of frequent and consistent **communication** of a variety of products with the Council; Models and Ecosystem Consideration reports are **bridges** among programs.

**C:** Council needs consistently delivered products but also flexibility for evolution of content; Updates have been opportunistic and project based; Lack of a structured portfolio of AFSC, regional, and national ecosystem activities to enhance efficient, iterative, communication between AFSC, councils, and stakeholders

**S:** Develop ecosystem portfolio (e.g. including stakeholder-driven conceptual models), have AFSC and Council prioritize and define.



**PORTFOLIO GAP EXAMPLE:** There is no AFSC “Research Alliance” for adult fish on par with RPA for recruits - need to coordinate/prioritize field research on adult life-history, growth, feeding movement, local depletion, fisher & protected species interactions.

**S: DATA IN:** sharing culture, strong use of accessible, known databases, **RESULTS OUT:** Large variety of products (models, reports, eco-indicators) for 4 LMEs.

**C:** Internal databases lack universal access; models and indicators need regular updates; poor data awareness, many model output requests internally and externally.

**S:** Establish open access databases across divisions, improve both internal and external scripts library and web-tools for data access and exploration, make consistent data/indicator provision part of performance plans.

**S:** Cutting-edge **high-performance computing** work AFSC/PMEL/UW.

**C:** HPC & large data handling (transfer, storage) resources strained; DOC IT policies hinder collaboration.

**S:** Update infrastructure with expectation of “big computing”; explore NOAA HPC, universities, cloud.

**S:** Multimodel ensemble suite suitable for management stays up-to-date with unique data source (food habits).

**C:** For management needs, suite needs to be kept updated consistently but uses soft/unstable funding.

**S:** Increase **stable funding sources/FTEs** for both ecosystem modeling and food habits program(s) to establish operational status on par with stock assessments.